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This paper must be cited as:

Tellechea-Luzardo, JA.; Otero-Muras, I.; Goñi-Moreno, A.; Carbonell, P. (2022). Fast biofoundries: coping with the challenges of biomanufacturing. Trends in Biotechnology. 40(7):831-842. https://doi.org/10.1016/j.tibtech.2021.12.006



The final publication is available at https://doi.org/10.1016/j.tibtech.2021.12.006

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Additional Information

1	Fast biofoundries: coping with the challenges of biomanufacturing
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12	*Correspondence: pablo.carbonell@upv.es
13	Keywords
14	Biofoundry, laboratory automation, engineering biology, biocomputation
15	Abstract
16 17 18	Biofoundries are highly automated facilities that enable the rapid and efficient design, build, test and learn cycle of biomanufacturing and engineering biology, which is applicable to both research and industrial production. However, developing a biofoundry platform can be expensive and time-
19 20 21	consuming. A biofoundry should grow organically, starting from a basic platform but with a vision for automation, equipment interoperability and efficiency. By thinking about strategies early in the process through process planning, simulation and optimization, bottlenecks can be identified and
22	resolved. Here we provide a survey of technological solutions in biofoundries, their advantages and

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- 23 limitations. We explore possible pathways towards the creation of a functional, early-phase
- 24 biofoundry, and strategies towards long-term sustainability.

25 Highlights.

- Laboratory automation is playing a crucial role in the development of synthetic biology
 methodologies, allowing fast and inexpensive engineering of genetic circuits for a wide
 range of biotechnological applications.
- Synthetic biology laboratories are in the midst of a paradigm shift, catalysed by biofoundries
 and their new approach to engineering biology.
- The innovative, resource-intensive and risky nature of biofoundries demand informed
 decisions before committing to building a new facility.

33 Biofoundries are changing how labs engineer biology.

34 Synthetic biology is an interdisciplinary field that combines biological, engineering and 35 computational principles to create complex biosystems [1,2]. To do this, scientists relied until 36 recently on bibliographic research and previous knowledge to design and build constructs, 37 essentially one by one. This process is time consuming and expensive and can be compared to the 38 early mechanical engineering steps where the production chain was almost completely manual [1]. 39 However, as with ancient handcrafts, scientific advancements are allowing the field to rapidly 40 evolve. A key is laboratory automation (see Glossary) that tries to achieve higher levels of 41 reproducibility, a feat that synthetic biology has been pursuing since its early stages [3]. Automation 42 opens up the possibility of establishing high-throughput synthetic biology, similar to modern 43 engineering technologies, where thousands of biosystems can be potentially built in short periods of 44 time. Automation allows error free protocols and 24/7 workflows. The throughput that is enabled 45 allows broad exploration of the design space and production of large variant libraries with the 46 generation of large data sets that can be used for future modelling and redesign.

Biofoundries are the biotechnological entities that can move forward this research area. Such a new
approach changes the paradigm of molecular biology laboratories towards laboratory automation,
data acquisition and integration and the use of mathematical models and artificial intelligence (AI)
technologies to tackle all the steps in the Design-Build-Test-Learn (DBTL) cycle. The

51 idiosyncrasy of the biofoundries perfectly fit into the DBTL cycle and complement it in several

- 52 ways. The biofoundry life cycle (see Key Figure) described in this work, showcases the main
- 53 possible tools, methods and processes driving the iterations of the DBTL cycle.

54 The interest in biofoundries as disruptive entities in the bioengineering field has been highlighted by

55 the creation in 2019 of a Global Alliance of Biofoundries (GBA) to coordinate their activity around

56 the world [4]. However, even though biofoundries appear as an essential actor for the long term

57 development of an engineering-like synthetic biology, they do not come without limitations and

58 setbacks, especially for newcomers. A detailed description of general considerations for research

59 groups interested in establishing a new biofoundry can be found in [5].

60 Here, we present a set of possible approaches to improve the current risk-benefit ratio of setting up

a biofoundry. We coin the concept of early-stage biofoundries and we propose different paths

62 towards building next-generation "fast biofoundries".

63 Early planification, the key.

64 The cost of establishing a biofoundry requires a long-term business model for biofoundry 65 sustainability that should be initially implemented considering both its potential users as well as 66 target market [5]. To that end, strategic analyses such as SWOT (strengths, weaknesses, 67 opportunities and threats), PESTLE (Political, Economic, Social, Technological, Legal and Environmental factors), and stakeholder analysis (Tables 1, 2 and 3 respectively) should provide a 68 69 better understanding of such a business model. In order to avoid market saturation, it is essential 70 that biofoundries find a trade-off between flexibility and specialisation into one particular niche of 71 the synthetic biology market.

As more automated laboratories are being established worldwide, higher standardisation,

73 provenance tracking, traceability and reproducibility among labs are achieved [6]. A business model

of biofoundry as a service has become possible, where each facility can specialise in some of the

75 tasks on the Design-Build-Test-Learn cycle rather than developing a fully automated engineering

76 platform. In such a scenario, a brokerage system should be put into place so that the different

complementary steps can be strategically outsourced to different labs. To that end, the adoption of

standards like the OpenMTA [7] by biofoundries for exchange of plasmids, strains, samples and

reagents would greatly promote collaborative research and joint efforts. Furthermore,

80 technoeconomic assessments and life cycle analysis should be implemented to evaluate the

81 technical and economic viability of the biofoundry, as well as the environmental impacts associated

82 with all stages of the product's life [8,9].

83 Finally, a good planification assessment for a nascent biofoundry is the description of a business

84 plan that among other things clearly defines the goals of the biofoundry, identifies all the key

85 players for its success and determines its incomes and outcomes of capital. Biofoundries (either

- 86 completely private or embedded in a public institution) need to endure, cover their costs and recover
- 87 the investment after a period of time. For that reason, we argue that a **business canvas model** is a
- 88 valid tool for biofoundries, even if their business model might not necessarily be focused on profit-
- 89 making plans.
- 90 To assist in this planning, we present in Figure 1 a suggested business model canvas designed for a
 91 generic biofoundry.

92 Biofoundries to address global challenges.

Next, we define two key example areas of research that can benefit from the methodologies used in
a biofoundry, whereas additional diversification paths that any biofoundry could take to supplement
their activity are discussed in Box 1.

96 Biofoundries for biomanufacturing.

97 Metabolic engineering uses synthetic biology tools and concepts to optimise the synthesis of a target compound, from single-cell to large-scale fermentations [10]. Synthetic biology and 98 99 metabolic engineering underpin modern biomanufacturing. Bioproduction usually relies on the 100 expression of metabolic pathways in host microorganisms in large scale fermentors and in the 101 purification of the target compound. However, the initial phases of development require molecular 102 biology techniques to establish the best producer candidates before scaling up. This stage requires 103 combinatorial DNA part assembly, it is time consuming and, thus, an excellent candidate for 104 automation. Notably, bioproduction has been at the forefront of the biofoundries' interests since the beginning. Some recent examples of biomanufacturing biofoundries include the SYNBIOCHEM 105 106 [11], the Agile [12] and the MIT Broad biofoundries [13]. In 2016, as a result of the pressure test administered by the U.S Defense Advanced Research Projects (DARPA) to assess the rapid 107 108 response capacity of biofoundries, the MIT-Broad Institute Foundry and academic partners 109 achieved initial production systems for 6 out of the 10 target molecules requested, in the given time limit of 90 days. Later, the SYNBIOCHEM biofoundry in Manchester accomplished the 110 production, from scratch, of 17 from 25 materials monomer targets in 85 days [11]. These tour de 111 112 force examples illustrate how automation helps make synbio faster, motivating the field to formalize this high-throughput and the integration in biofoundry platforms. A recent review 113 114 including these and other successful examples of biofoundries applying strain rapid prototyping for 115 biomanufacturing can be found in [14].

116 Biofoundries for genetic circuit engineering

117 The implementation of genetic circuits to dynamically control gene expression is at the core of 118 many synthetic biology applications. Such circuits are regulatory networks that turn inputs into outputs according to genetically-encoded rules-a genetic program. Although current circuits [15-119 120 17] are effective and predictable, there is ample room for improving their information-processing 121 capabilities by engineering increasingly complex and more robust devices [18]. To this end, a more 122 rigorous, while easy to scale-up, implementation process is needed. Within this context, 123 biofoundries can make a difference, allowing researchers to [i] better characterise the dynamic 124 features of biological parts and systems, and [ii] robustly build libraries for different genetic 125 programs.

126 Biofoundries can be used to automate the implementation of well-characterised libraries of genetic 127 parts [19] at relatively little cost. For example, allowing large-scale characterisations of genetic 128 noise. Since part performance is often far from digital (e.g. promoters with pure on/off behaviour), 129 the success of a biological program (even simple combinatorial logic gates) is often determined by 130 small noise patterns in, for instance, a regulatory protein [20] or an expression product [21]. 131 Characterising one part at a time is not only time-consuming, but impractical. Automation can help 132 building and testing sequence libraries, thus providing an overview of the parameter space of single 133 circuit nodes. While manual steps are error-prone and difficult to compare against each other, 134 automated implementation promises robust and standardised [22] building processes.

135 The development of synthetic biology *workflows* [23,24] and design automation pipelines [25] is

136 complementary to the establishment of biofoundries. Both efforts converge in, for instance,

137 bridging the gap between in-silico modelling and in-vivo testing; enabling model-based

138 implementations that will increase the accuracy of circuit behaviour. Considering circuit inputs (i.e.

139 with which the genetic circuit is regulated), biofoundries offer the potential test features such as

140 gradients and environmental conditions—via liquid handling robots—informed by previous in-

silico models. As for the algorithmic performance of the circuit, different measuring techniques will

allow for a more detailed dynamic characterisation. For instance, a biofoundry setup with bioreactor

143 modules for continuous culture can test evolutionary dynamics, which will ultimately inform

144 mathematical models for a better biodesign. We argue that the coupling of models and

145 experiments—let alone data science—will be greatly enhanced by the use of automation facilities.

146 The catalogue of techniques for measuring circuit output can be expanded—beyond the use of

147 fluorescence proteins—targeting specific case-studies. For instance, in order to measure stochastic

148 perturbations in transcriptional networks (e.g. for analogue computing [26]), the automation

- 149 pipeline should contain machinery for RNAseq data (or even Ribo-Seq units [27]). Other
- applications may require the characterisation of cells under the microscope via microfluidic
- 151 devices—even the use of optical tweezers may help gather the correct data for the biological
- 152 process at stake.

153 A biofoundry's starting package.

154 Basic equipment.

The cost of the equipment required to set up any synthetic biology laboratory and especially the 155 156 Build and Test divisions of a biofoundry can add up to five or even six figure budgets in euros. This 157 can be a hindrance that may lead teams to give up their interest and transition into more affordable 158 projects. A trade-off between abandoning altogether the conversion of a laboratory into a 159 biofoundry facility and investing a substantial spending effort may be to start small and grow at a 160 slow pace towards a fully automated and integrated laboratory [5]. This, coupled with collaborative 161 work with different laboratories with different expertises and equipment availability, distributes the 162 workload of the biofoundry, easing the transition to an optimal setup. In addition, we argue that, at least in the early phases of development, currently available options allow researchers to set up 163 164 functional semi-automated laboratories with limited resources that may act as a spearhead for further funding. These affordable options are arguably faster to fund and obtain than more 165 166 expensive alternatives for most labs and can provide feedback on the needs of the biofoundry before committing to more expensive equipment alternatives. Another important factor to take into account 167 168 is the adaptability required to incorporate biofoundry principles into a traditional laboratory, in 169 particular, the upgrade of essential laboratory equipment needed to transition into automation. For 170 instance, the new setup for a biofoundry is going to need higher throughput in basic tasks like PCR and centrifugation. Acquiring one or more 96-well thermal cyclers and plate swing bucket 171 172 centrifuges can hugely decrease the time to production and increase the modularity in the 173 biofoundry.

Apart from the more traditional options of renting and second-hand purchasing, affordable and Do
It Yourself (DIY) equipment and open-source hardware are becoming more present in the synbio
laboratories. Next we describe some equipment alternatives and some considerations to bear in
mind before acquiring or building one.

Quite likely, the first major piece of equipment of any biofoundry (apart from essential devices in a
 molecular biology laboratory like freezers, centrifuges, incubators and thermocyclers) would be an
 automated liquid handler [5]. The community has developed open-source alternatives for liquid

181 handlers like EvoBot [28] and OpenLH [29]. When looking for affordable commercial options, the 182 Opentrons robot stands out. Starting at 5000\$, this open-source liquid handler can meet the requirements of an early biofoundry and since it can be programmatically controlled using custom 183 made scripts it is suited for the data integration required for this kind of laboratories as previously 184 185 described. Opentron robotic platforms also allow a good level of customisation and adaptation to 186 different purposes, something needed in biofoundries when not all the pieces of equipment required 187 for a project can be afforded. This has been highlighted in [30], where the authors managed to adapt 188 an Opentrons OT-1 to pippet nanoliters of samples. In 2020, Storch and colleagues [31] described 189 the adaptation of Opentron equipment to the low-cost assembly of genetic parts (ranging at a cost of 190 \$1.50-\$5.50 per construct), something fundamental for any synthetic biology project. After the 191 assembly reaction, the circuit in a plasmid needs to be transformed, usually in E. coli, to be 192 propagated. However, the transformation procedure is a bottleneck for automation since it requires 193 heat shock or electroporation treatments to be added to the robotic pipeline. To solve this, in [32] it 194 was described the automation of the cloning and transformation protocols using natural 195 transformation capabilities of Acinetobacter bayly using an Opentrons robot.

196 Currently, the market offers a wide range of liquid handlers options available in the mid or top-197 range pricing options like the Hamilton's STAR, Eppendor's EpiMotion or the Tecan's Evo. Newer 198 technologies, away from the traditional liquid dispensing based on pipette tips include the Labcyte's 199 Echo and iDOT alternatives.

200 After constructing the desired circuit, the usual next step is transformation in a plasmid-propagating 201 strain. Researchers need to pick transformant colonies and test them for the presence of the target 202 genes and phenotype. This tedious task can be automated using colony-pickers. Low-cost 203 commercial options for this piece of equipment are generally still not available, however there are 204 alternatives to consider. For instance, in 2019 the Marburg iGEM (2019.igem.org/Team:Marburg/) 205 turned the OT-2 into a colony picker by adding a RaspberryPi and a camera to an Opentrons robot 206 to identify colonies in the agar plate. The robot then lowers the pipette tip into the colony coordinate 207 and transfers it to another location. In addition to this addon to a commercial liquid handler, in 2018 208 [33] researchers described the construction of a colony picking robot that, instead of sterile tips, 209 heats a needle at 400°C to sterilise it and continue the picking operation at an estimated rate of 2400 210 colonies/hr, however no details of the total costs of construction are given.

It is always important to check the results of the genetic engineering process via sequencing. For
small-scale engineering experiments like cloning reactions, the go-to option of most laboratories is

an outsourced Sanger sequencing service. However, when the number of samples to be sequenced is

- 214 high or the engineering process may have involved genomic changes, NGS can be a better
- alternative. If the laboratory wants to sequence their own strains or plasmids in-house, Nanopore
- 216 DNA sequencing devices like MinIon offer affordable, quick, high throughput results [34].

The next step in a standard experimental workflow, would likely be culturing the colonies in liquid media and obtaining early and quick results like growth profiles, fluorescence emission or other

219 types of measurable outputs from the engineered strains. Plate readers are the instrument of choice

in this case. However, more affordable alternatives are called for. To this end, in 2019 Karol and

221 coworkers [35] presented an open-source plate reader with absorbance, fluorescence emission

reading and optogenetic capabilities. The instrument can be built for \$3500 and can be

223 programmatically controlled through Python.

224 Other experiments require deeper understanding and control of the media and growth profile for 225 longer periods of time and mimic early scale-up conditions before proceeding to more industrial 226 settings. Bioreactors are the instruments of choice in this case. Nevertheless, the prices of traditional 227 commercial bench-top bioreactors are particularly high. In recent years several studies have shown 228 the possibility of building homemade bioreactors. In [36], researchers built a reactor at ~700€ per 229 four-chemostat module. It allows several types of experiment to be run at the same time and the size 230 of the vessel (a commonly used laboratory bottle) allows it to run replicates in parallel. A highly 231 customizable DIY framework for automated cell growth experiments was presented in [37]. 232 eVOLVER, was specially designed with the high-throughput required in modern laboratories in 233 mind. The article described the evolution study of yeast in 78 different culture-density windows 234 during 500 hours. In 2020, Steel and colleagues presented Chi.Bio [38], a platform for automated 235 characterisation and manipulation of biological systems. The research shows that it can be used to 236 study cell growth, biofilm formation, optogenetics and fluorescence emission detection. Chi.Bio is 237 now commercially available.

Interesting extra addons, for more specific biofoundries are also available. Two examples can befound in Box 2.

240 *The power of software and data integration.*

Similarly as with lab hardware equipment, computational tools and software resources are present everywhere through the DBTL cycle of a biofoundry as they provide the means for automation and efficient operation. BioCAD (Computer-aided Design) tools are commonly used in biofoundries to explore the metabolic design space, to identify promising pathways and enzymes, and to perform the design of experiments (DoE) for their combinatorial assembly with DNA regulatory parts, aswell as to optimize process conditions [39].

Besides BioCAD tools, lab automation software is essential to bridge models with experimental protocols. This step has long been seen as a bottleneck because most lab equipment generally relies on vendor software that can be hardly integrated into a DBTL pipeline. Such limitations are currently being lifted thanks to the emergence of open-source robotics such as OpenTrons and more awareness from vendors about open biomanufacturing initiatives. Solutions for laboratory digitization such as the open-source Standardization in Lab Automation 2 (SiLA2) [40] used for device communication are also allowing flexible integration of workflows.

254 Vertical integration of workflows through software and automation interoperability will boost their 255 rapid turn-around. However, one of the bottlenecks in order to automate a biofoundry is the lack of 256 standardisation of software. Most of the vendor software found at biofoundries is proprietary and 257 does not allow for interoperability. Some initiatives like SynBioPython [41] have been recently 258 addressing that issue. Moreover, data integration through software interoperability allows for effective experimental planning based on design of experiments. Such strategy has been 259 260 advantageously implemented in the manufacturing and chemical industry but is an often-oversight 261 strategy in synthetic biology labs. One of the advantages of data integration is that it allows for the 262 organisation of information and prior knowledge in a way that can be used to optimise the experimental design. Another strategy that should be kept in mind is that rather than focusing on 263 264 achieving the best titers in the micro well-plates in an automated liquid handling platform. experimental planning should anticipate the challenges of scaling up the process by exploring the 265 design space. Different factors might have different effects depending on the scale. In some cases, 266 exchanging of enzyme variants might lead to important improvements [42], whereas genetic 267 regulation in others can be a key factor in order to increase production [43]. Similarly, changes in 268 269 process conditions such as media or fermentation parameters might be in some cases critical parameters leading to the most efficient solution. The ability of anticipating which factor would 270 271 bring to larger improvements at industrial scale is one the major challenges for biofoundries.

272 Concluding Remarks and Future Perspectives.

273 The take-home concepts described in this article have been summarised in the Key Figure where we 274 propose an expanded biofoundry lifecycle, hand in hand with the DTBL cycle. Biofoundry facilities 275 have popped up in recent years across the globe with the aim of automating and speeding up 276 synthetic biology in its transition into a biomanufacturing technology for the bioeconomy. Beyond 277 the hype, establishing a successful biofoundry platform requires careful planning studies and should 278 be underpinned by an infrastructure of computational resources as well as DBTL-enabling lab 279 facilities. The human resources may be often forgotten in these plans and are, however, crucial for 280 the success of such an interdisciplinary field. As in traditional IT, training and retaining the 281 invaluable staff is paramount. Personnel can be considered as a more important asset than 282 equipment since well-trained staff provide continuity to projects and funding [5]. Universities play a key role in providing key personnel and, importantly, in facilitating the creation of biofoundries by, 283 284 for instance, chaperoning the new initiative until funding independence is reached or via incubators 285 or accelerators of entrepreneurial ideas.

286 Community-wide open-source initiatives including software, hardware and open transfer 287 agreements should help to improve affordability and communication among biofoundries and 288 laboratories as well as to enhance collaborative solutions to meet common challenges (operational, 289 technological and others). Understanding the technological capabilities and limits of those low and 290 mid-end equipment compared with high-cost solutions and addressing other biofoundry-related 291 current issues (see Outstanding Questions), will allow the full exploitation of the true capabilities of 292 these entities. Besides, joint efforts of biofoundries working closely with producers of automation 293 can contribute to the development of new hardware capabilities as it has been already shown in 294 some pioneering experiences [30,31].

295 Towards smart biomanufacturing, mathematical modelling and computational tools should play a 296 key role to further rationalise, automate, and accelerate the DBTL, identifying those principles that 297 can be generalised as well as enabling a better translation of large-scale conditions to facilitate the 298 scale-up. Importantly, initiatives are currently being undertaken in several biofoundries to address 299 the challenges of scaling and realising economic value at scale. In order to stand out from the 300 crowd, biofoundries should diversify their activities and focus not only on industrial 301 biomanufacturing but also on other cutting-edge engineering biology applications like 302 biocomputation.

Notwithstanding the aforementioned challenges, biofoundries are strengthening their position as
hubs of expertise for automation and innovative solutions for the life sciences, as well as for

305 industrial translation [44], acting also as a bridge between fundamental and applied research. 306 Collaborations with industrial partners (or fees for service work) can actually provide a good 307 sustainability model for biofoundries while helping de-risk industrial delivery. Industry partners 308 may not always be willing to share information, especially what could be advantageous, such as the 309 best technique or method to solve an issue along the pipeline. For instance, the concept of a 310 distributed biofoundry would make more sense-in principle-within academic laboratories. 311 Academic projects are usually driven by public funding and are mainly focused on basic research 312 which define different timescales than industry. However, it is true that current policies defined by 313 major public agencies have brought the spotlight into closing the gap between academia and 314 industry.

315 While the goals of academic and industrial projects are different, techniques and methods are alike. The use of liquid-handling robots, DNA synthesis or characterisation tools is equally important for 316 317 both. In a similar way that GenBank was created in the late 70s by an academic laboratory and it is 318 now a basic information tool underpinning many industrial applications, biofoundries could well 319 imply a step-change regardless of the aims of the project at stake. Developing appropriate cost models to make biofoundries widely available is a key to democratising synthetic biology, opening 320 321 up cutting-edge high throughput experiments to a wider range of groups, including distant research 322 and industrial teams lacking those physical resources in their regions or countries.

Finally, the encouraging role of biofoundries to meet global challenges (health, food, water, energy 323 324 and environment [45]) should be emphasised. Scientific innovations provide solutions to existing 325 challenges. How are solutions being generated/optimised? What is the balance between new 326 appearing challenges and solution generation? In a time where data analysis, predictions and 327 sophisticated designs are heavily assisted by in-silico tools, the physical generation of new molecular-based solutions is slowed down by trial-and-error procedures. Biofoundries can 1) reduce 328 329 construction time, and 2) scale-up both complexity and size-from virus vaccines, to crop engineering and bioremediation strategies. Addressing global challenges is an area of activity 330 331 within the Global Alliance of Biofoundries, which has become particularly relevant during the 332 current pandemic [44], demonstrating how biofoundries are suited to face the shortage of key 333 reagents and could crucially contribute anticipating needs during a global crisis [46].

334

335 Outstanding Questions Box

336	•	How can we efficiently train new personnel in the use of automated laboratories and their
337		data integration? How can the valuable staff be retained afterwards?
338	٠	How well do DIY and low-cost commercial equipment compare to more consolidated
339		market options? What features (time, efficiency, disponibility of resources) are being
340		traded off when acquiring each affordable alternative?
341	•	Are all the available computational tools up to the challenge? Are they adapted for an
342		interdisciplinary user?
343	٠	Do any ethical concerns arise from the use of biofoundries to solve biotechnological
344		problems?
345	٠	Are Universities, academic research centres and the industry ready for this new type of
346		service? What can be done to accelerate the education of possible stakeholders when
347		biofoundries are alien to them?
348	٠	How should the biofoundry concept be reshaped in order to be better aligned with current
349		global challenges such as the sustainable bioeconomy?
350	٠	What are the challenges for biofoundries in order to become a key player of Industry 4.0
351		rather than a subsidiary technology, i.e. achieving a biofoundry-based smart circular
352		economy through digitalization, artificial intelligence, IoT, blockchain, etc?
353		
354	Text I	Boxes

355 Box 1. Diversification of biofoundries.

A key outcome of early planning should be the realisation of the possibility to diversify the activities of the future biofoundry. To survive, biofoundries and their defining laboratories must find the niches needed by the community nearby. To do this, the divisions conforming a distributed biofoundry can focus on one main activity and also gain thrust, partners and funding doing other types of biotechnological services that deliver products demanded by the industry if they need to. Now we briefly describe some examples of possible services a biofoundry can provide to supplement its activity.

Amplification of DNA parts and their assembly is a cornerstone of a biofoundry. This kind of <u>cloning service</u> can be demanded by a big range of academic and industrial groups that may need high-throughput cloning, transformation and DNA purification services for any of their projects. The DAMP biofoundry already offers this service in its catalogue (<u>damplab.org</u>).

<u>Protein production</u> is a growing market both for industrial and research purposes where high quality proteins with specific functionalities are needed in big quantities. To find and characterise new proteins, expression and purification protocols must be optimized which often requires a big experimental effort that automated laboratories can help to define. For example, Dudley and coworkers [47] described the expression and characterisation of plant proteins via a biofoundry to improve and speed-up the DBTL cycles towards a more high-throughput protein expression optimization workflow. The system is based on automation to assemble the DNA parts, prepare the plasmids, express the proteins through transformation *in planta* or via a cell-free approach and quantify the expression. Another interesting alternative that would benefit from the biofoundry's services is the microbial-based production of antibodies [48] that can take advantage of combinatorial library assembly to generate antibody variants with new activities [49].

The current volume of prospected and engineered microbial strains and plasmids is pointing at a needed <u>sequencing</u> rate that can only be achieved through the use of automated laboratories that prepare the samples, build the libraries and run the sequencing reactions as fast and precisely as possible. For example, the Agile Biofoundry (<u>agilebiofoundry.org</u>) has incorporated NGS pipelines into some of its laboratories to validate the results of the build phase of their projects.

Finally, the COVID-19 pandemic demonstrated that biofoundries have an important role to play when fast and high-throughput developments are needed to tackle big problems. Biofoundries can help in the <u>diagnosis</u>, as shown by members of the London Biofoundry developed in [50] an alternative diagnostics pipeline and procedure by quickly adapting their automation facility. Additionally, the DAMP Biofoundry developed a large-scale automated testing facility to help in the diagnosis of the virus.

356

Box 2. Two biofoundry equipment add-ons that can be useful for specific purposes.

3D-printers. For all the steps involved in the normal function of a biofoundry, some project-specific adaptations of the equipment may be required. This can be facilitated by 3-D printers.

The **3D-printing** revolution has reached the synthetic biology laboratories. The possibility to manufacture quick, in-house, custom made, low-cost and complex plastic components for day-to-day life in a molecular biology laboratory is incredibly attractive. Different projects may require very specific elements that can be expensive or may not even exist. Biofoundries face the same problem, exacerbated by the need of high-throughput and the integration between automated components to be as seamless as possible. Some of the previously cited projects use 3D printing to build some of their parts [28–30,35,37]. 3D printers can also be used for more general procedures like the fabrication of custom-made components (e.g. special plates) required for specific pieces of equipment that can be expensive if bought from the manufacturer.

Microfluidics. Applied to synthetic biology, microfluidics has been proposed for various uses in the "build" and "test" phase of the DBTL cycle [51], as a technology to facilitate, automate, miniaturize and reduce the price of fluid manipulation and to reach a fully integrated synthetic biology research pipeline. Much like liquid handlers (but at a micro scale), microfluidics can be used to mix DNA parts automatically and quickly build thousands of constructs. Microfluidics devices however can be expensive to manufacture and operate. For this reason, in 2015 [52] it was presented a 3D-printed microfluidics prototype able to assemble DNA parts through Golden Gate. A low-cost commercial microfluidics kit was presented in 2017 [53] as an affordable DIY circuit building and testing device.

358

366

preparation...)

359 Glossary

360	•	3D-printing: 3D-printers use thin threads of melted plastic, added layer by layer to create
361		three dimensional structures.
362	•	Artificial intelligence: decision-making strategies through the DBTL cycle based on
363		algorithms with the ability of learning from experimental data.
364	•	Automated liquid handler: used to automate the liquid transfer between tubes and plates
365		required to carry out the reactions needed in the engineering process (PCR, cloning, DNA

Biofoundries: specialized laboratories that combine software-based design and automated
 or semi-automated pipelines to build and test genetic devices.

- Biomanufacturing: an industrial technology whose main goal is to allow the industries to
 move from chemical processes to greener, bio-based ones. In its core, biomanufacturing
 uses biological systems (living organisms, cell extracts, tissues, enzymes) to try to produce
 valuable molecules
- Cellular computing / biocomputing: Cellular computing can be defined as the search for
 synthetic biological systems that are able to process inputs and deliver outputs according to
 pre-defined algorithmic rules that are encoded into genetic components.
- Colony picker: automated robots designed to identify colonies in an agar plate, pick them
 and transfer them into other plates for replication or into liquid media for other purposes.
- Design-Build-Test-Learn: applied to bioengineering, the DBTL cycle tries to meet a
 particular design criteria in a biosystem by iterating through the four distinct phases of the
 cycle applying the obtained knowledge of the previous iterations to better the next designs.
- Laboratory automation: set of strategies designed to improve the laboratory
 methodologies reducing human error, costs and time to production using automated
 equipment, handing over the baton of tedious laboratory work.
- Microfluidics: refers to the study, manufacture and utilization of miniaturized devices
 interconnected through micro-scale channels designed to manipulate small droplets of fluid
 from attoliters to nanolitres.
- Standardization: developing and implementing synthetic biology standards to maximize
 modularity, reproducibility, traceability and quality of the engineered systems.
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- 395 Tables

Strengths	Weaknesses	
Fast response	Inefficiency of one-size-fits-all solutions	
Lowering risks of failure by automation and	Higher uncertainty than its chemical industry	
standardisation	counterparts	
Opportunities Addressing future demands of the bioeconomy New therapeutics, materials and other valuable bio-based products	Threats Quick obsolescence due to a fast-paced technology field High investment in order to reach competitiveness	

397 can provide a fast response thanks to automation and, thus, lower the risk of failure. Weaknesses are

398 mainly seen in the fact that the flexible nature of a biofoundry might render it less efficient than a

399 more focused facility. Similarly, biofoundries rely on biological processes to produce high-value

- 400 compounds, which are often prone to higher uncertainties in comparison with the production
- 401 process of the same compound in the chemical industry. Notwithstanding those challenges,
- 402 biofundries can deliver solutions to address the demands of the bioeconomy.

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Political	R&D funding policy. Trade restrictions.
Economic	Economic growth. Exchange, inflation, and interest rates. Investors' interests.
Socio-cultural	Safety perception. Ethical issues. Ageing population.
Technological	Automation. AI. DNA technologies. Lack of specialised workforce.
Legal	GMO regulations. Health regulations. Food regulations. H&S.
Environmental	Climate change. Bioeconomy and circular economy.

403 Table 2. PESTLE analysis of establishing a biofoundry. The key factors influencing a biofoundry

404 are complex and may arise from the political and economic environments. Moreover socio-cultural,

405 technological, legal and environmental aspects have an impact on the biofoundry and therefore need

406 to be considered in the establishing of a biofoundry.

	Low interest	High interest
High power	Keep satisfied	Manage/Engage closely
	Funding bodies Finance Consultants	Scientific Advisory Board Executive staff Project manager Financial sponsor
Low power	Monitor	Keep informed
	General public Operations/IT Administrative support	Team members Users Sales Technical sponsor Vendors

411 Table 3. Stakeholder analysis of a biofoundry. Relevant and interested parties have been identified

412 at the different levels typically found in a biofoundry.

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416 Figures

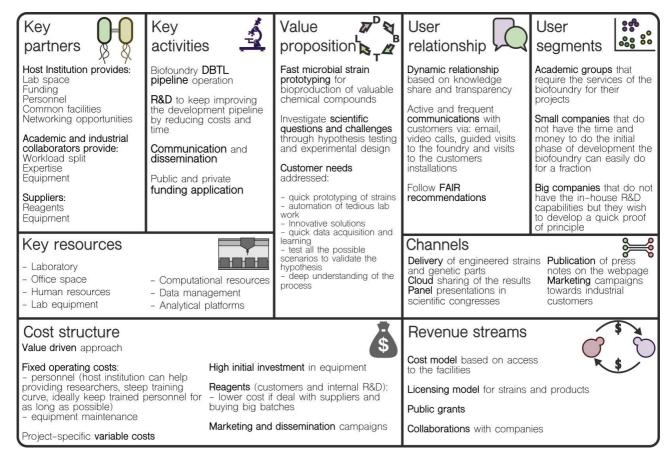
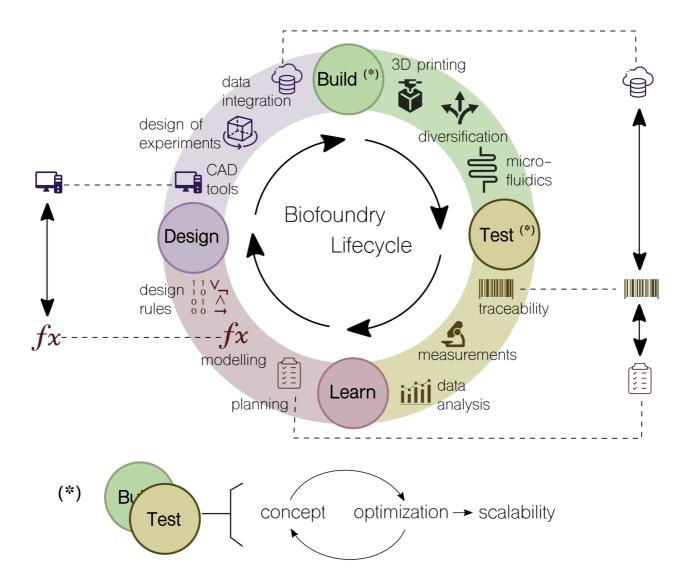


Figure 1. Biofoundry business model canvas. This model has been designed from the perspective of a biofoundry operating within an academic institution. From its inception, the biofoundry needs to define the cooperation with its key partners (e.g. host institution, collaborators and suppliers). Key partners can be of huge help in closing deals, especially during early stages of growth. Another important detail of the canvas is the definition of user of the biofoundry. In essence, a user is anyone interested in the biofoundry's services and that is willing to compensate its work either through direct payment or through the application to funding grants.



426 Key figure. The complex biofoundry lifecycle. The cycle goes around the DBTL engineering 427 principles, where stage specifics depend on biofoundry capabilities and goals. Two features that go 428 beyond the typical cycle, and are relevant to biofoundry setups, are highlighted here: what we 429 termed extra-cycle interactions (dotted lines), and the loop inside Build-Test that goes from concept 430 to optimization to scalability. The extra-cycle interplay that links modelling (Learn) and CAD tools 431 (Design), for instance, would be the target of a biofoundry that is heavily focussed on characterisation and design. Emphasising the link between data integration (Design) and traceability 432 433 (Test) would make sense for specific applications, such as evolutionary studies. All these have implications on the type of facilities that are needed. The loop inside Build-Test needs careful 434 435 considerations in biofoundries that target high volumes of output, such as bioproduction of 436 chemicals.

438 Acknowledgments

- 439 The authors thank Dr. Rosalind Le Feuvre, Manchester SYNBIOCHEM Centre, for providing440 insightful discussions.
- 441 JTL was supported by the Next Generation EU (NGEU) fund through the Spanish Recovery,
- 442 Transformation and Resilience Plan via a Margarita Salas personal grant from the Spanish Ministry
- 443 of Universities (UNI/551/2021). IOM was supported by CSIC intramural project PIE 20211CT006.
- 444 AG-M was supported by the grants BioSinT-CM [Y2020/TCS-6555] and CONTEXT [Atracción de
- Talento Program; 2019-T1/BIO-14053] Projects of the Comunidad de Madrid, MULTI-SYSBIO
- 446 [PID2020-117205GA-I00] and the Severo Ochoa Program for Centres of Excellence in R&D [SEV-
- 447 2016-0672] (2017–2021) from MCIN / Agencia Estatal de Investigación of Spain. PC was
- 448 supported by MCIN/AEI/10.13039/501100011033 BIODYNAMICS grant number PID2020-
- 449 117271RB-C21 and Universitat Politècnica de València Talento Programme.
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